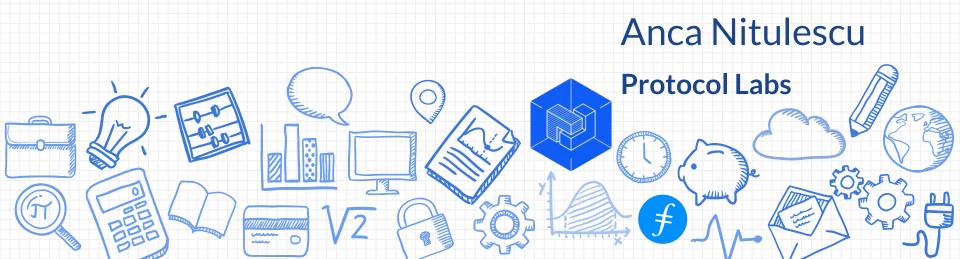
Verifiable Computation over Encrypted Data: SNARKs and more

29 March 2022 - FHE.org





Client:

- × limited storage
- × minimal operating system
- × limited computational power

Server

Cloud Service

x provides storage

Client

2



Client

3

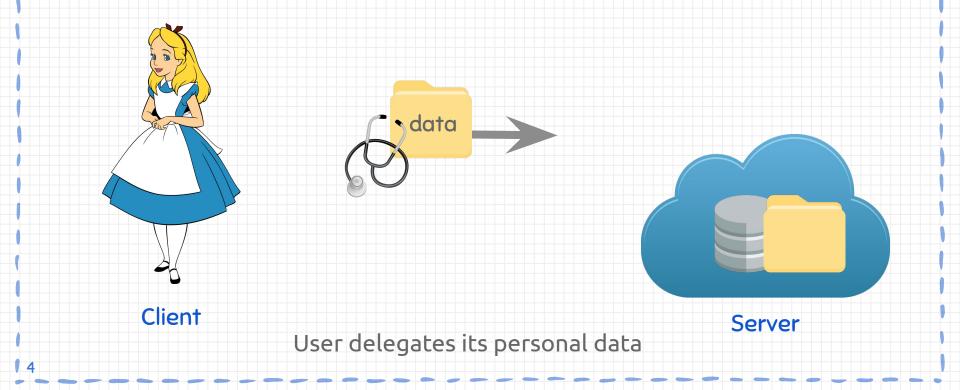
Client:

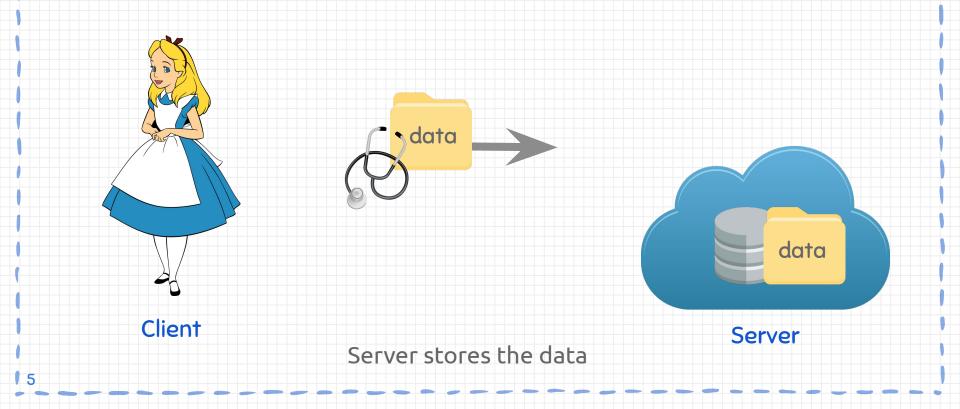
- × limited storage
- × minimal operating system
- × limited computational power

Cloud Service

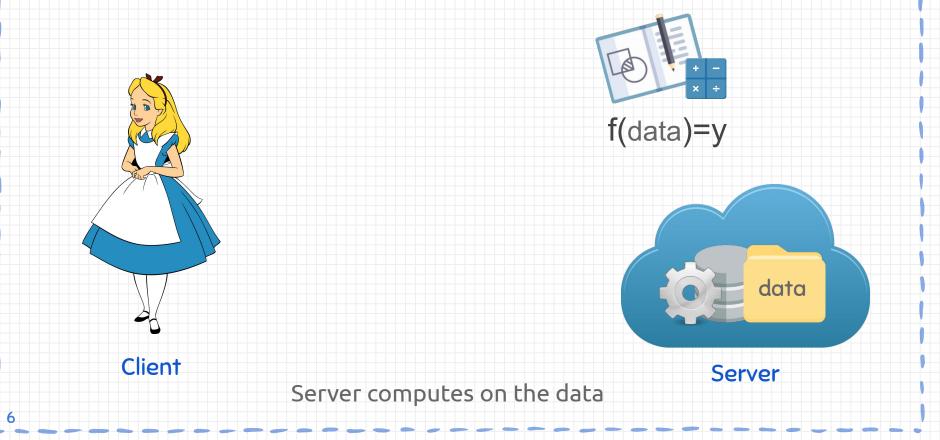
- **X** provides storage
- **x** computing power
- × network
- × software

Server

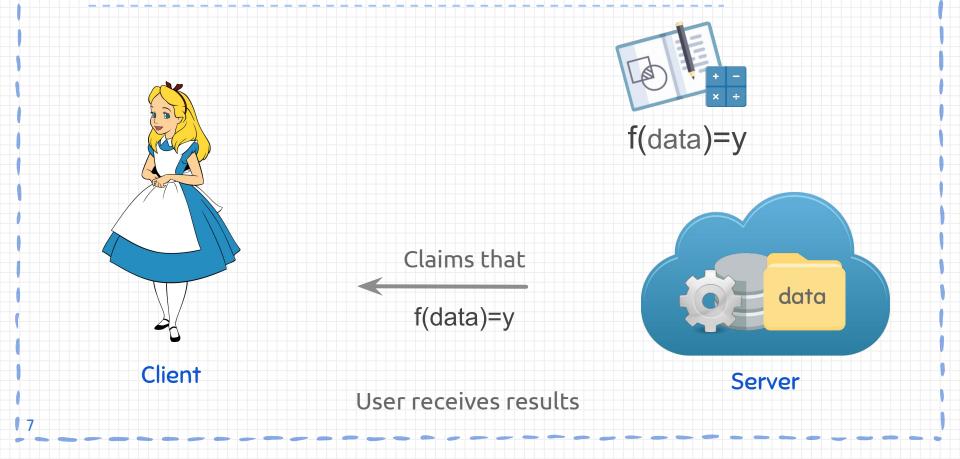


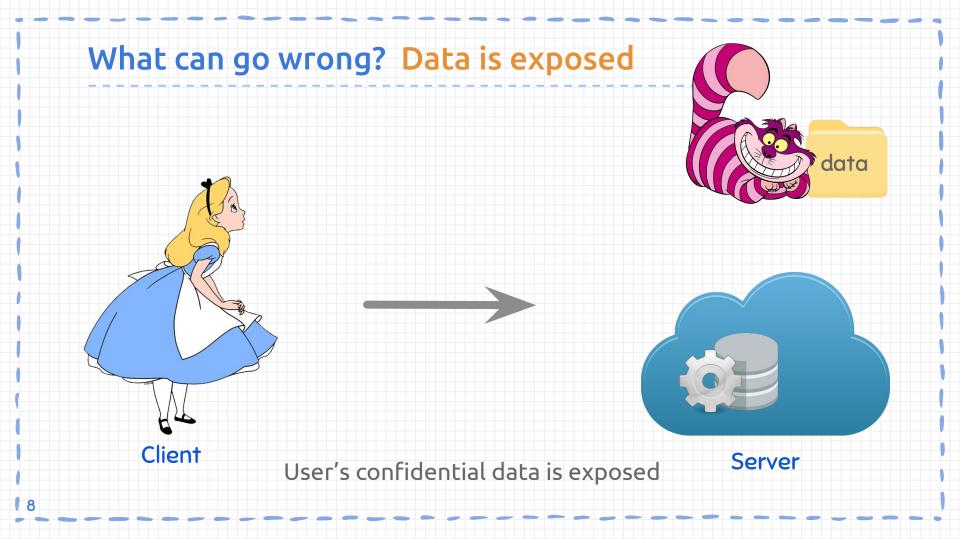


Computation Delegation

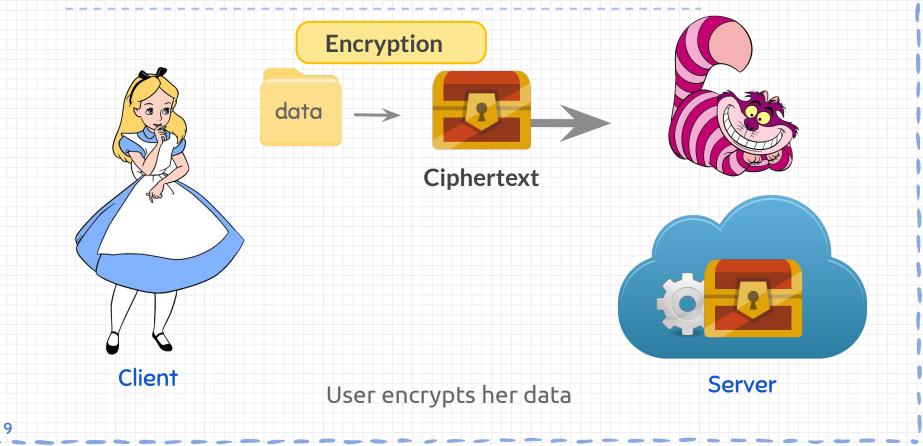


Computation Delegation





FHE: Solution for Privacy of Inputs



FHE: Solution for Privacy of Inputs



Encryption

Homomorphic Encryption

- **×** Privacy of inputs
- ✗ Malleability of data
- **X** Privacy of output

[Gen09, BGV12, GSW13, TFHE (CGGI16), CKKS17...]

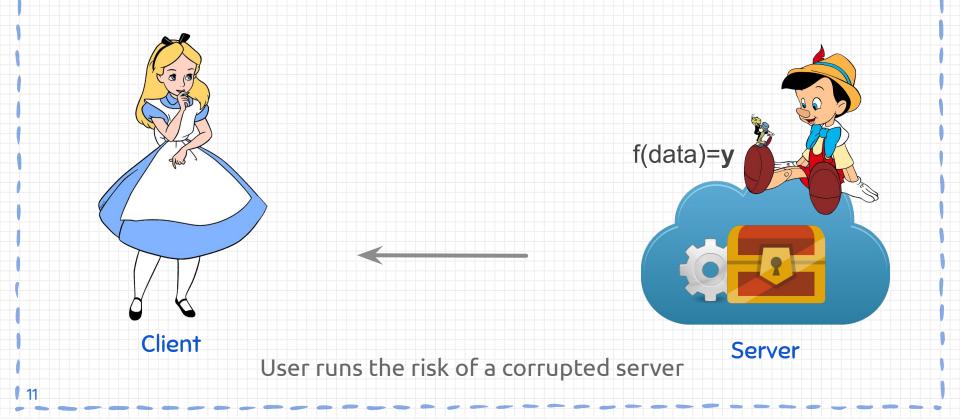
Client

10

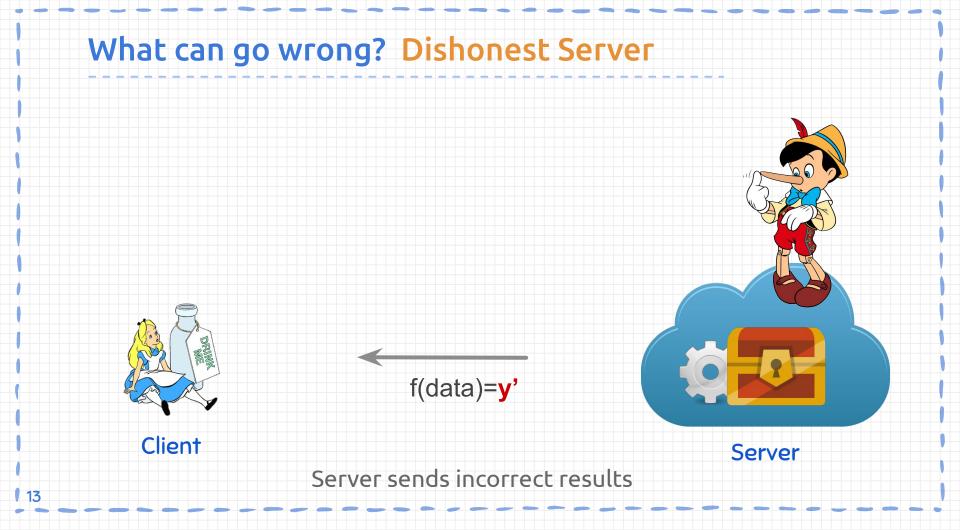
User encrypts her data

Server

What can go wrong? Dishonest Server



What can go wrong? Dishonest Server f(data)=y f(data)=y' Client Server Server sends incorrect results 1 12



SNARK: Solution for integrity of results Verifiable Computation 10 f(x)π Client Server User asks for a proof 1 14

SNARK: Solution for integrity of results

Verifiable Computation

SNARKs

× Proof is succinct

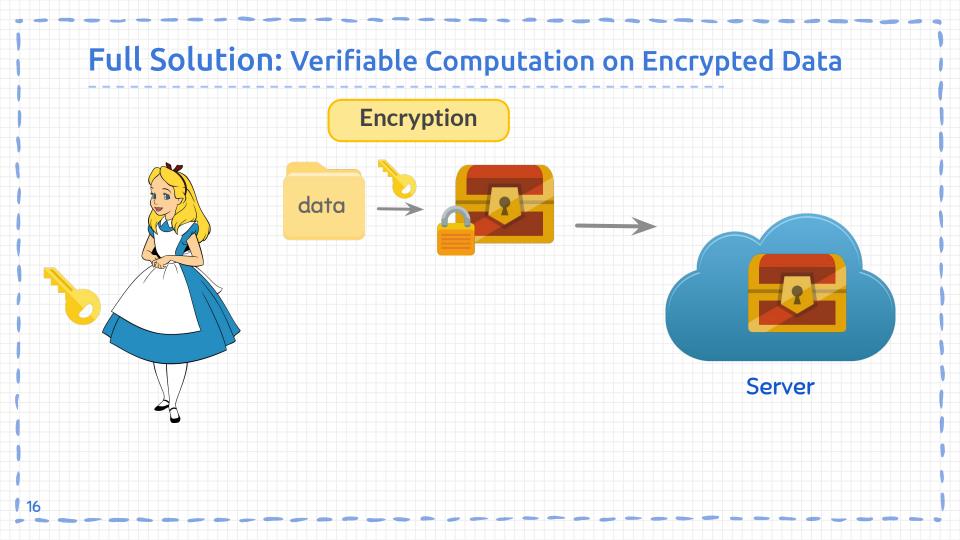
Client

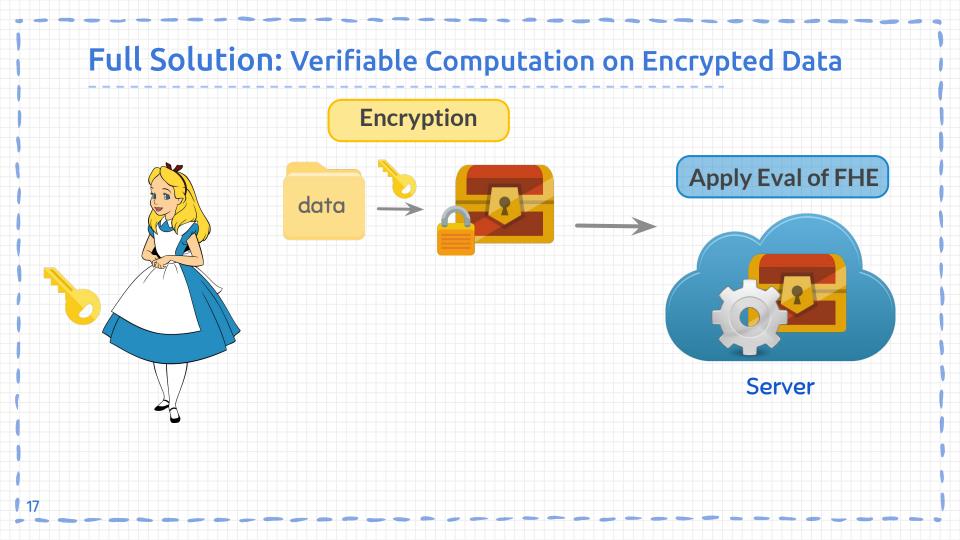
15

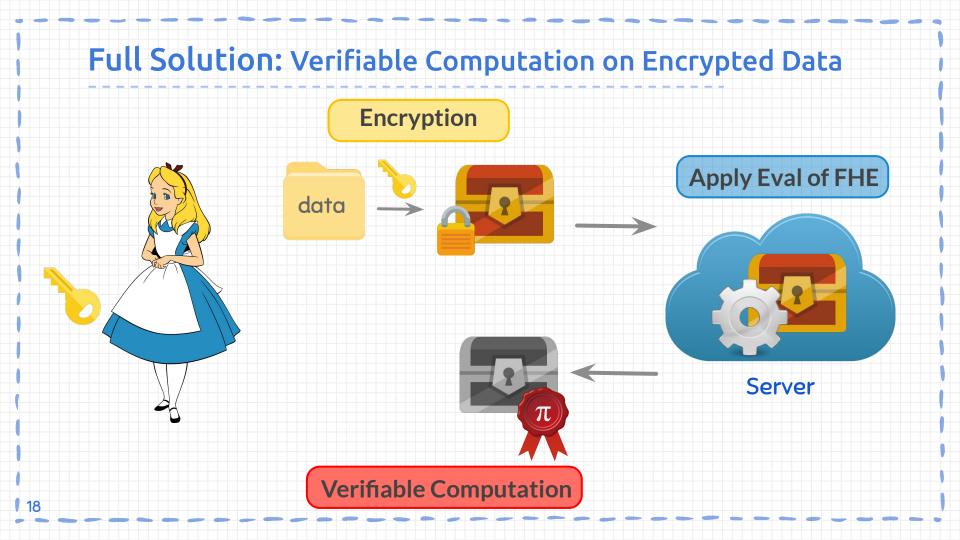
- **X** Minimal interaction
- **X** Client verifies efficiently

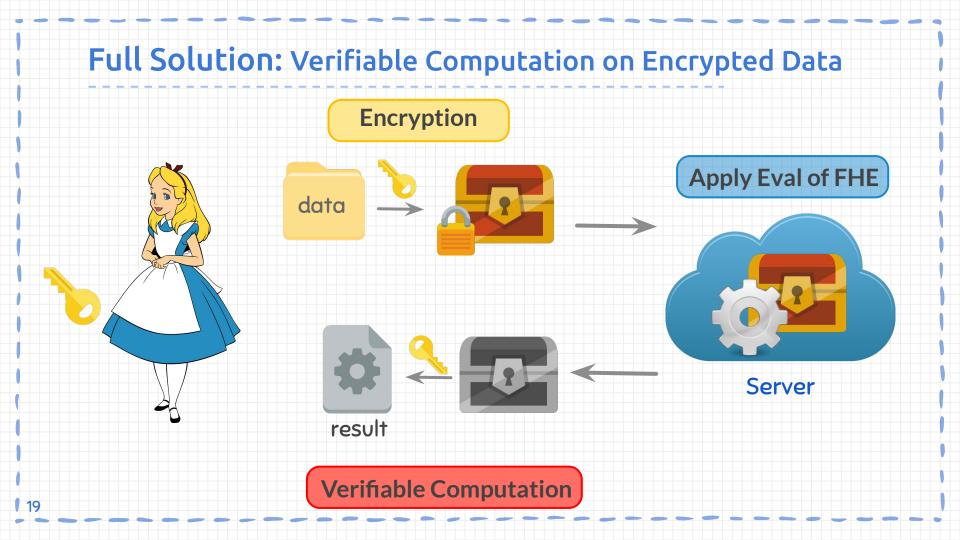
[GGP10, GGPR13, PHGR13, Gro16, BBC+18...]

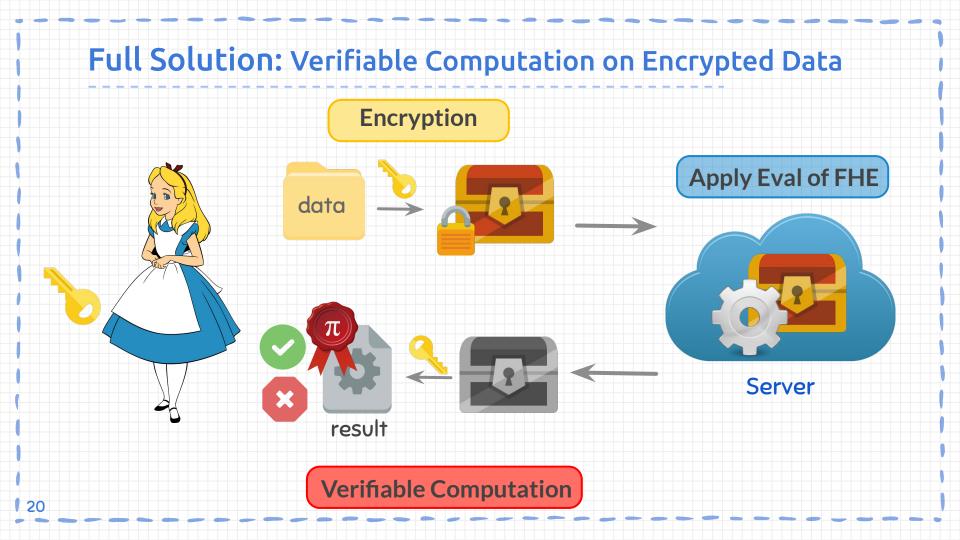












Privacy-preserving Verifiable Computation

Boosted SNARKs with data privacy for the inputs and outputs [PKC:FNP20] Boosting Verifiable Computation on Encrypted Data Dario Fiore, Anca Nitulescu, David Pointcheval

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Short-sighted SNARKs for Private Polynomial Evaluation and PSI

[EP:2021/1291] MyOPE: Malicious securitY for Oblivious Polynomial Evaluation Malika Izabachène, Anca Nitulescu, Paola de Perthuis, David Pointcheval

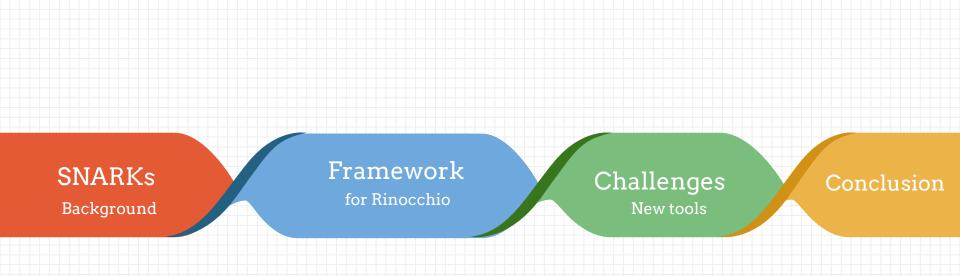
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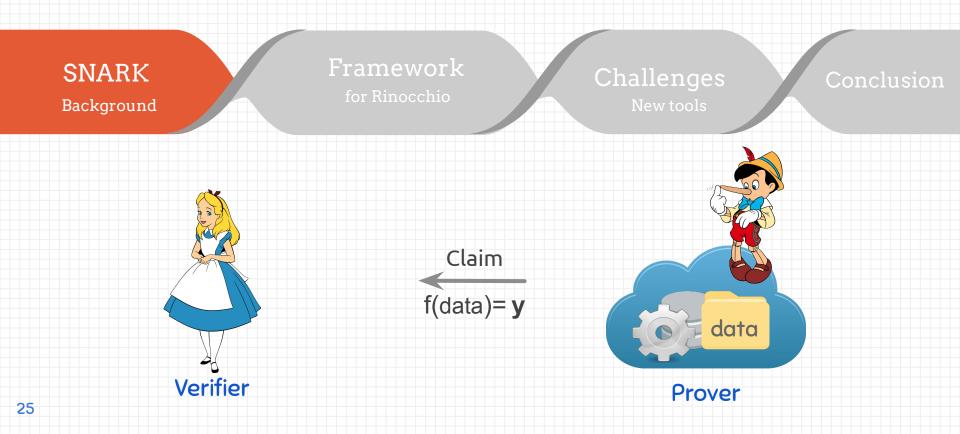
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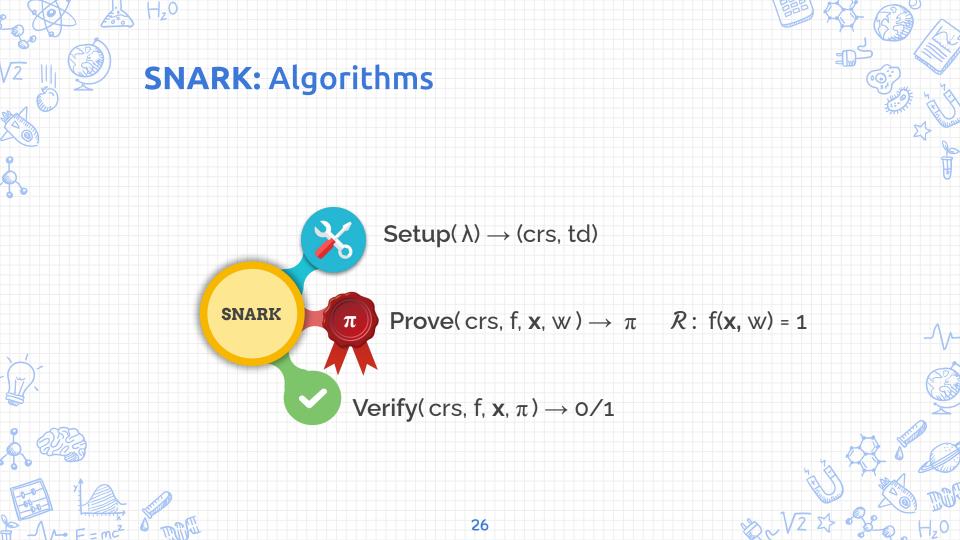
SNARKs compatible with FHE ciphertexts based on LWE rings [EP:2021/322] *Rinocchio: SNARKs for Ring Arithmetic* Chaya Ganesh, **Anca Nitulescu**, Eduardo Soria-Vazquez

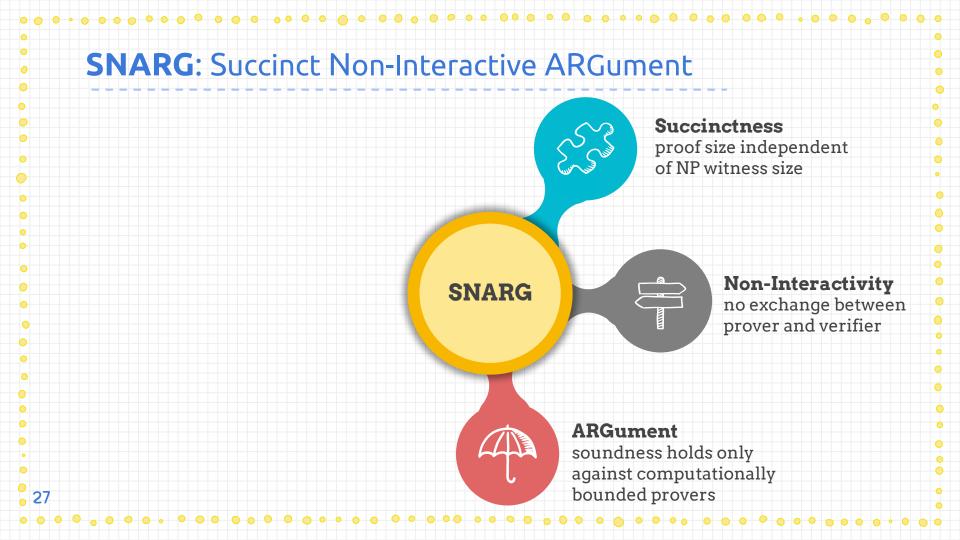
Outline

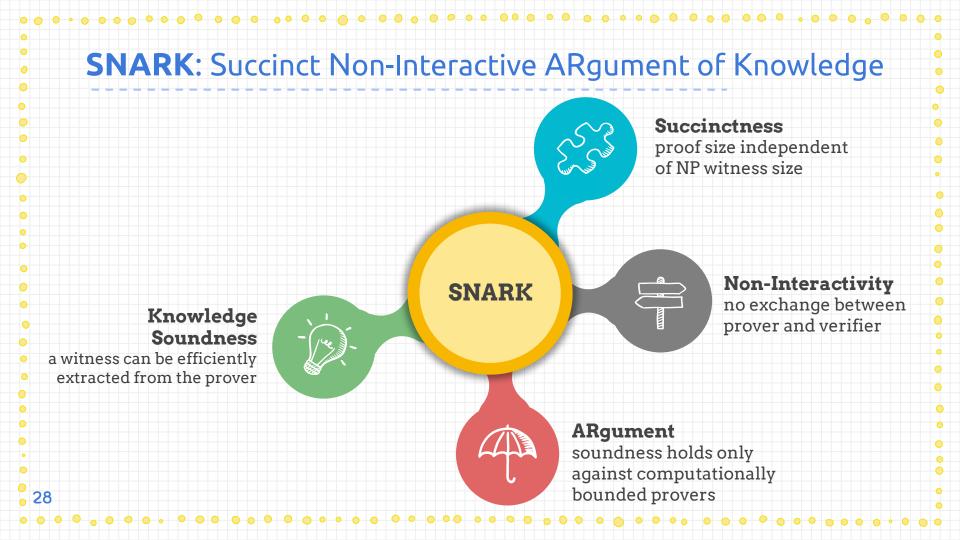


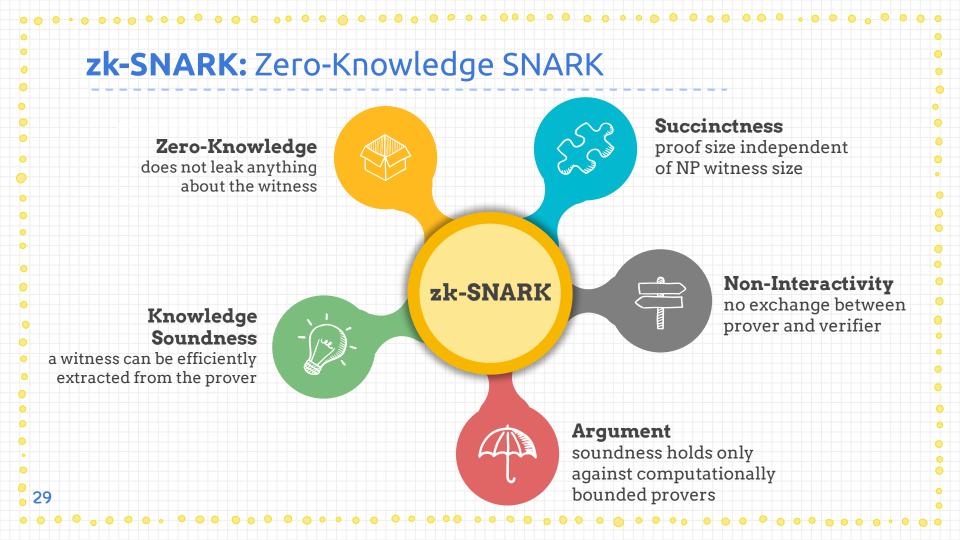
Introduction to SNARKs



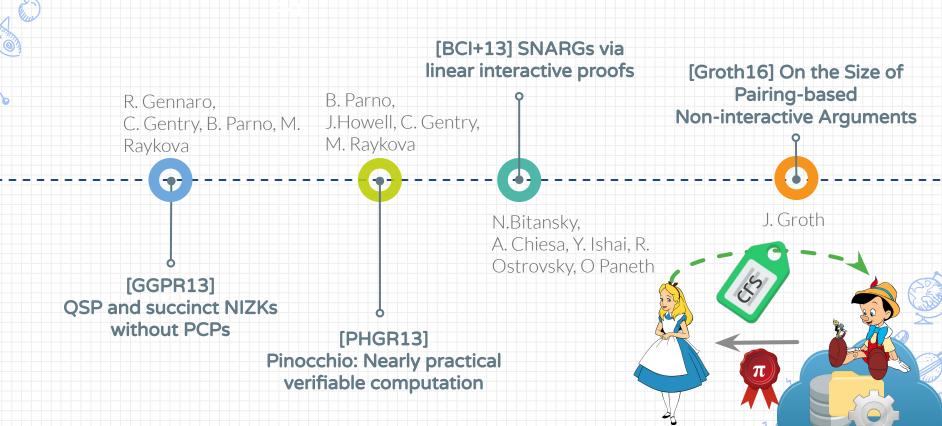




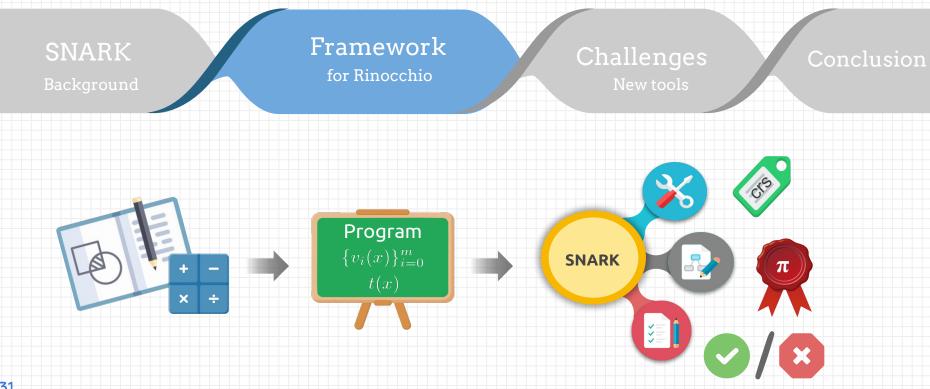




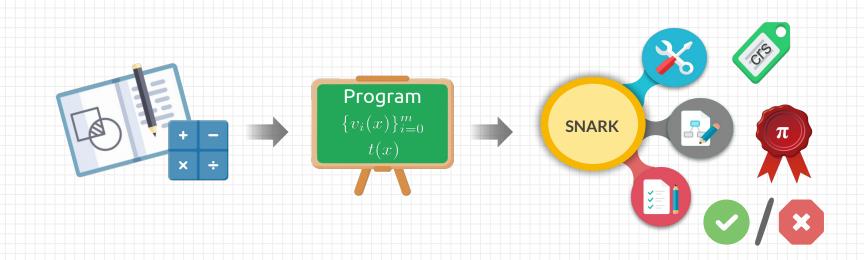
SNARKs: Preprocessing for constant size proofs



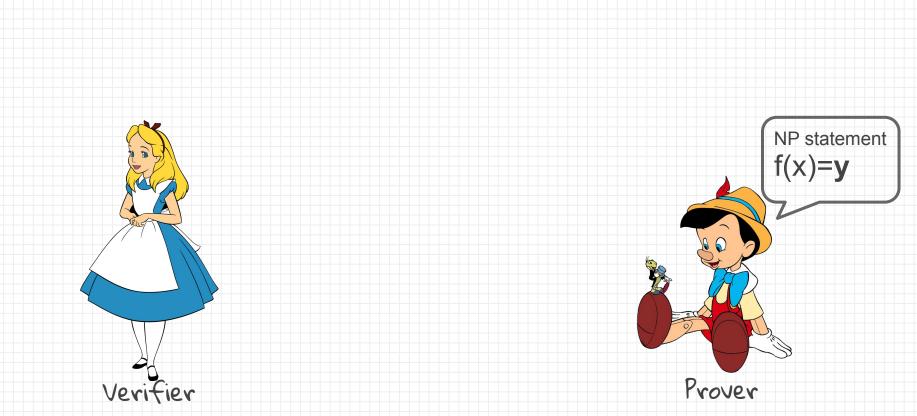
Key Steps to Build SNARKs



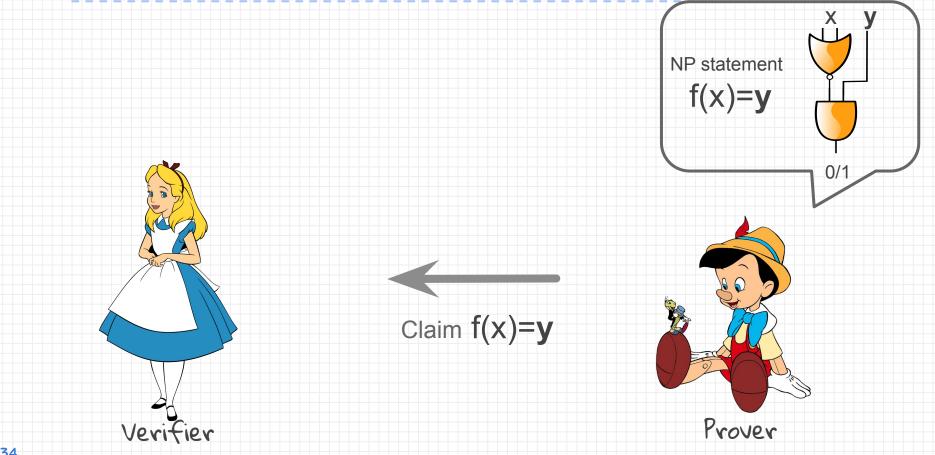
Frameworks for SNARKs



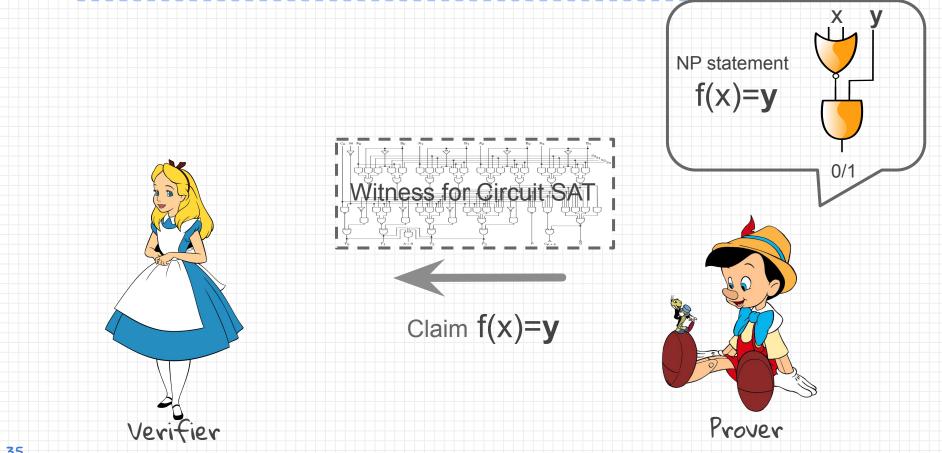
Proving NP statements



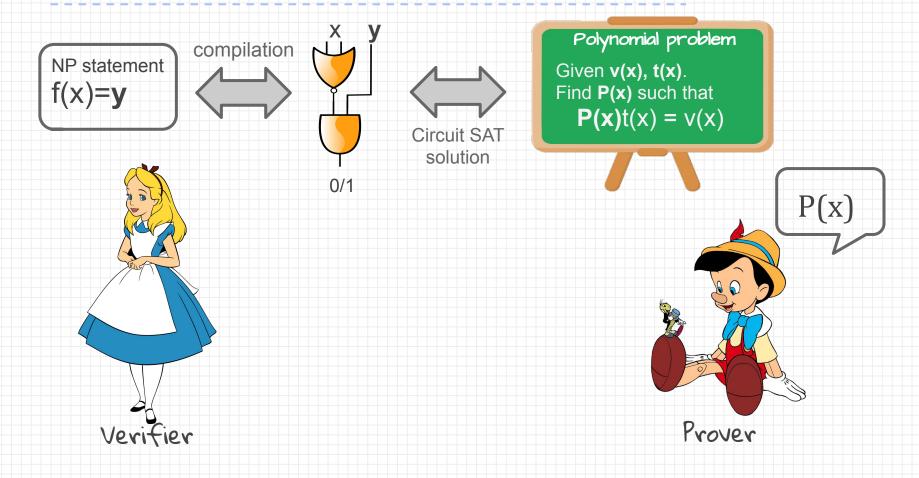
Computation: Circuit SAT



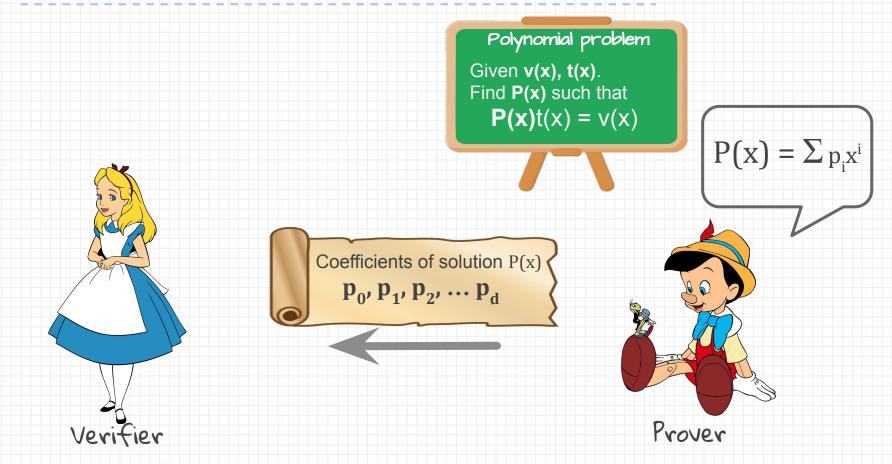
NP witness: Too long!



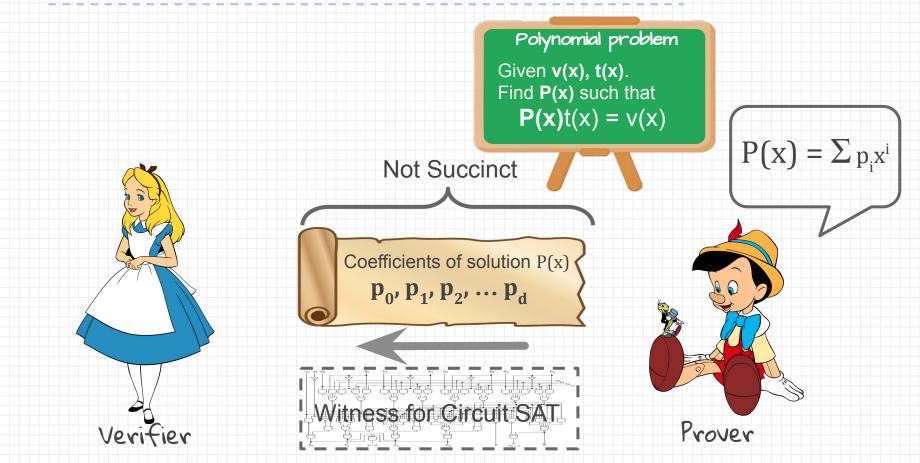
Prover solves equivalent problem instead



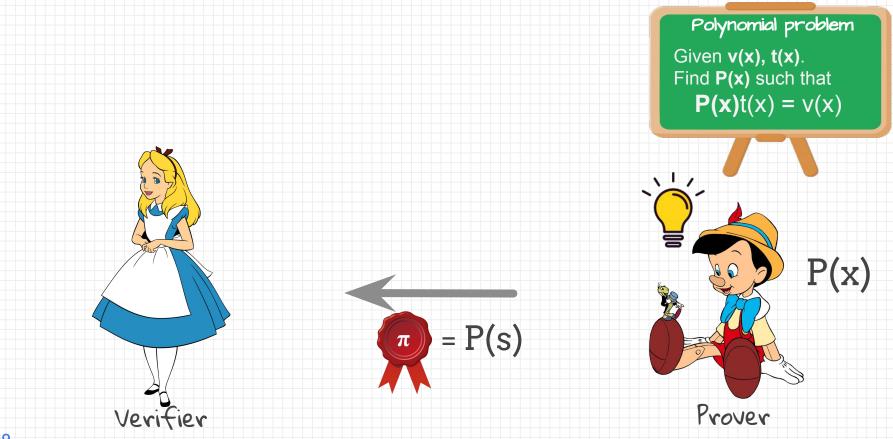
Prover shows polynomial: too long



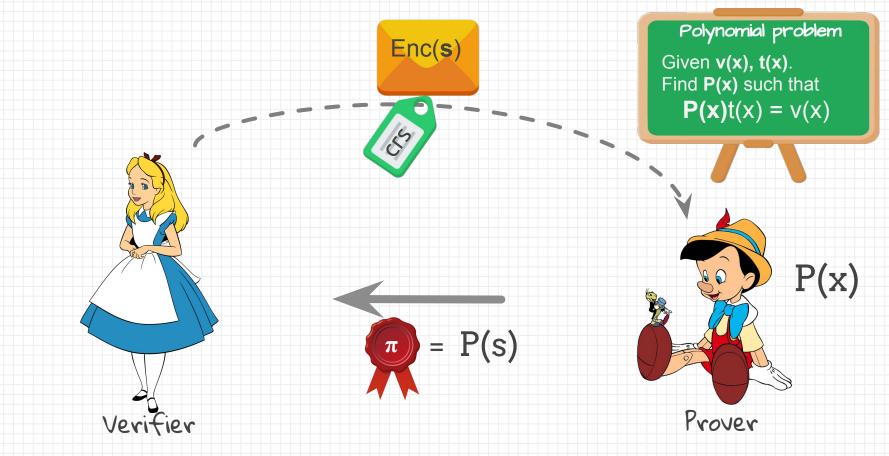
Prover shows polynomial: too long



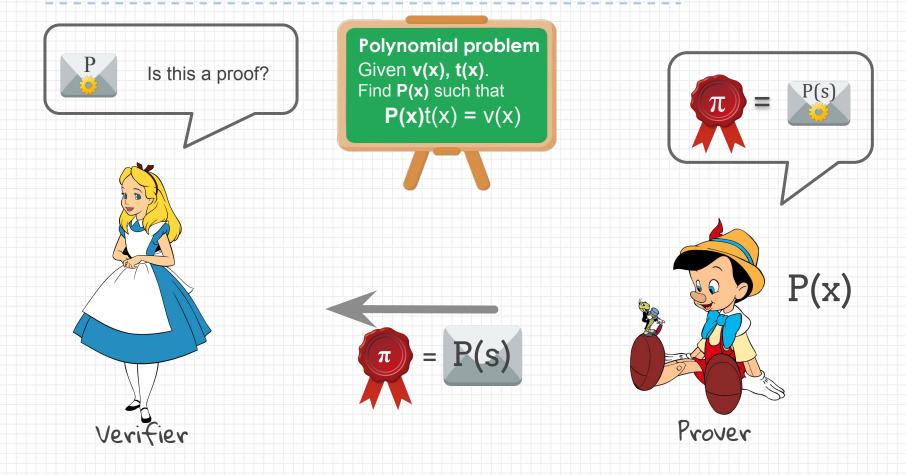
Evaluate solution at point s



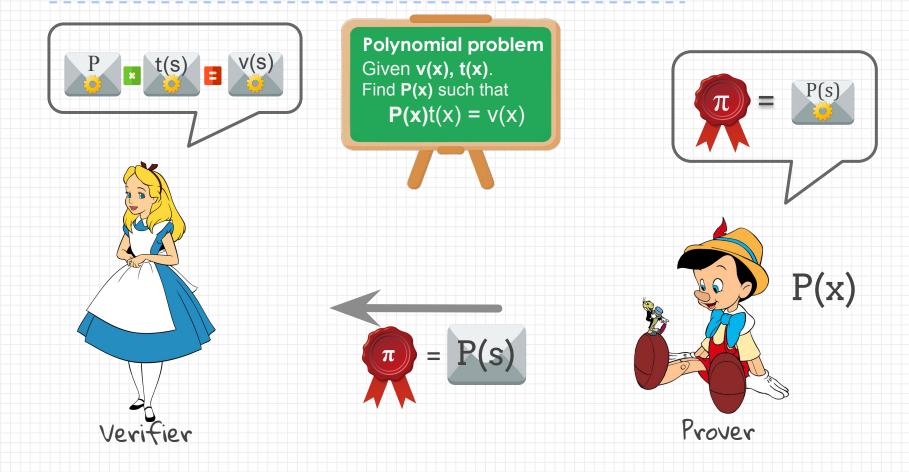
Evaluate solution at point s



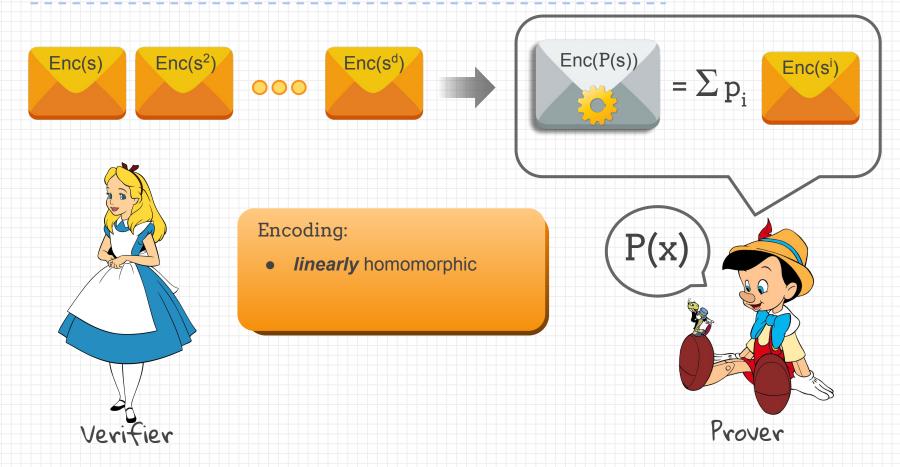
General SNARK framework



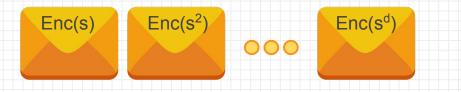
Verification in a single point

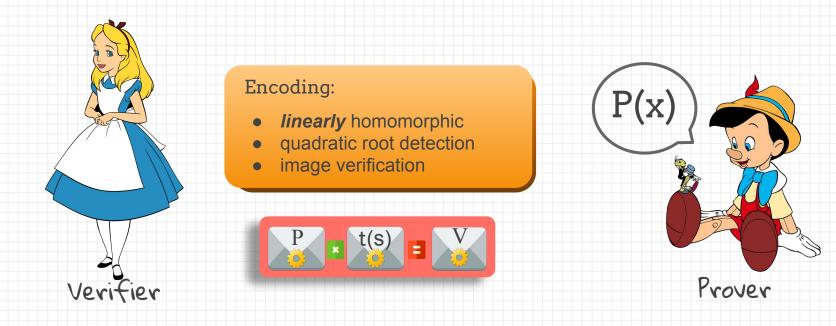


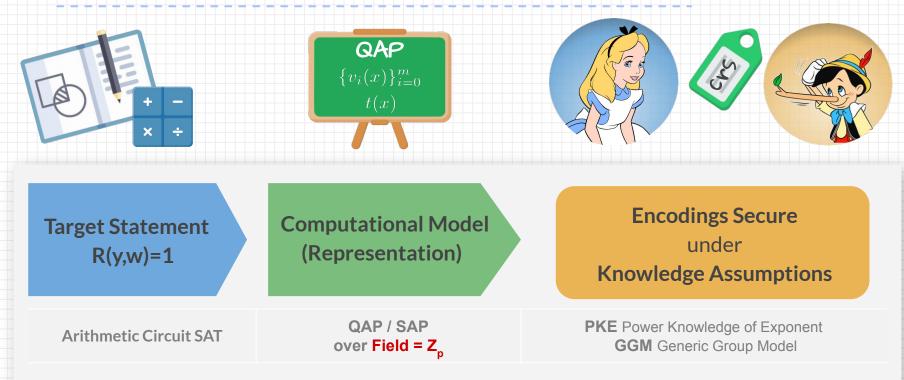
Encoding Properties for Verification

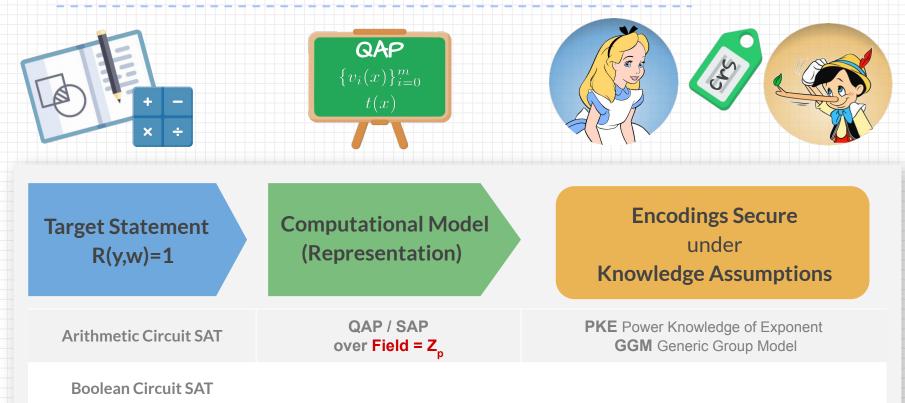


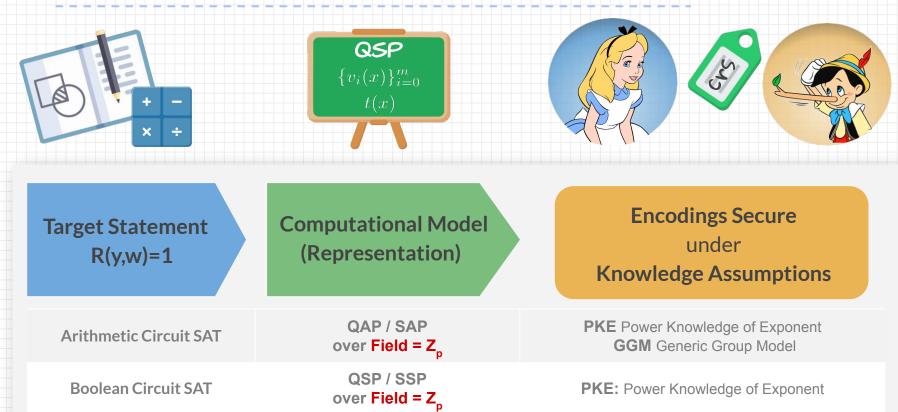
Encoding Properties for Verification

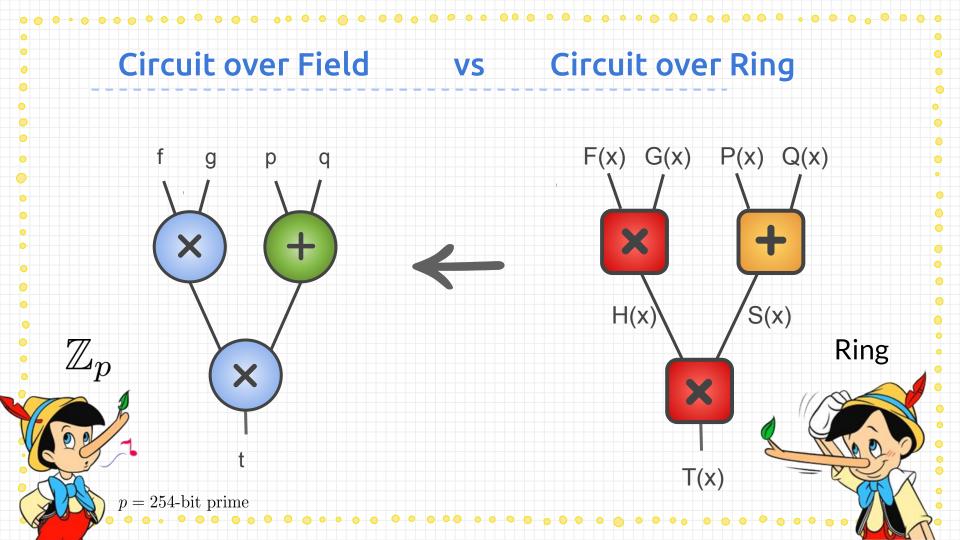


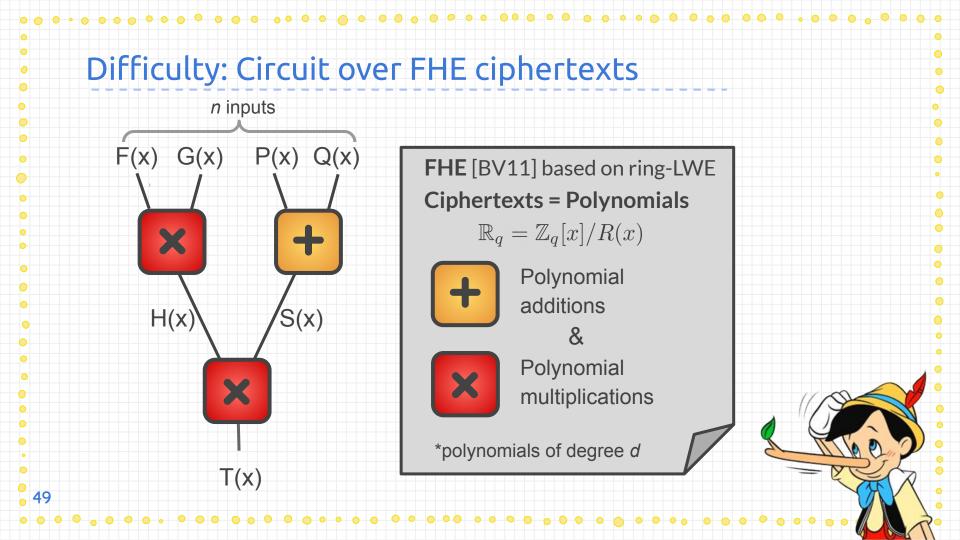


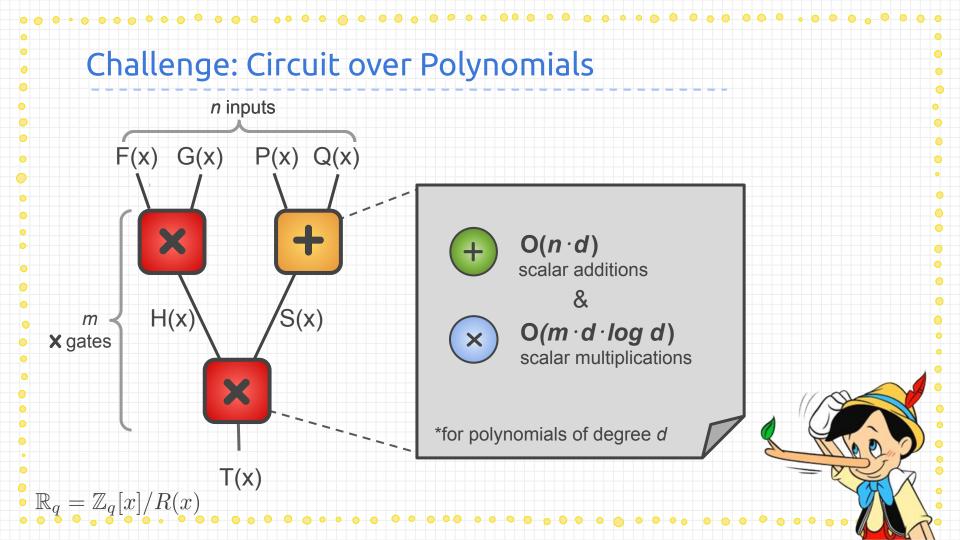


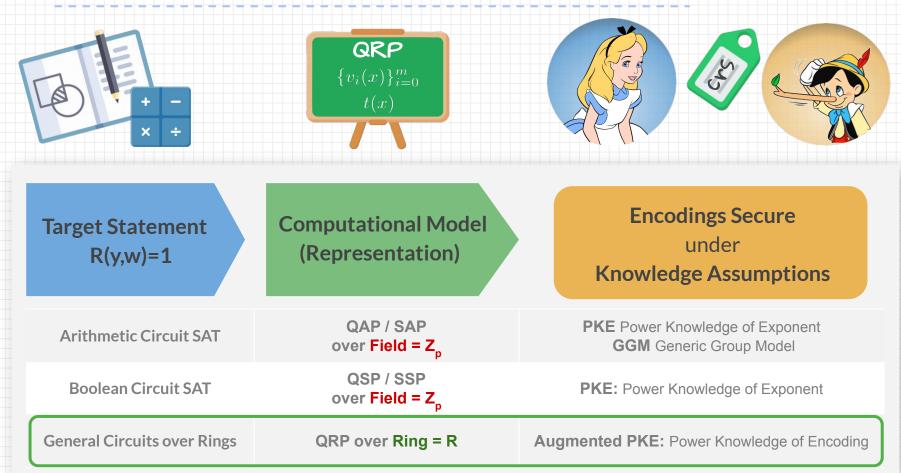


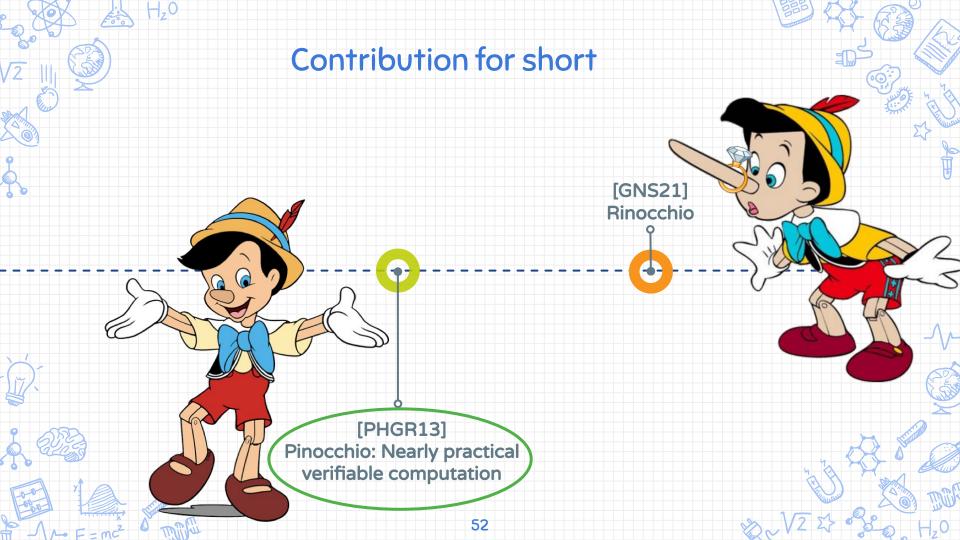




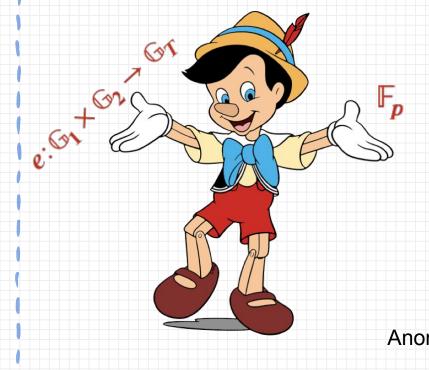








More SNARKs applications



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Outsourcing computation (on encrypted data)

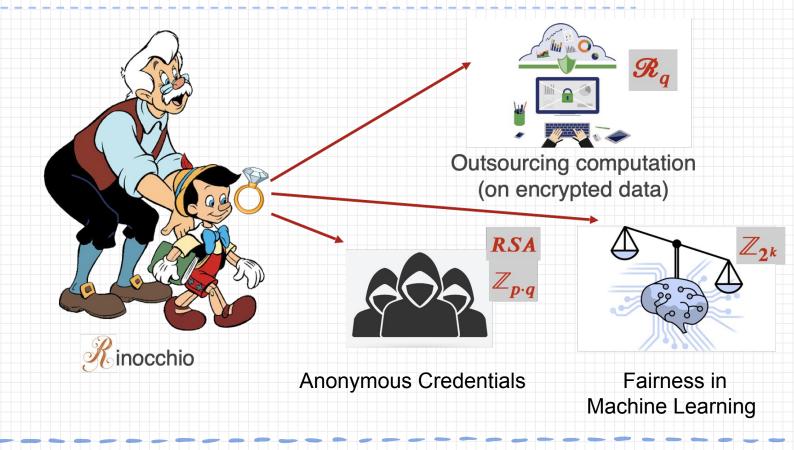


Anonymous Credentials

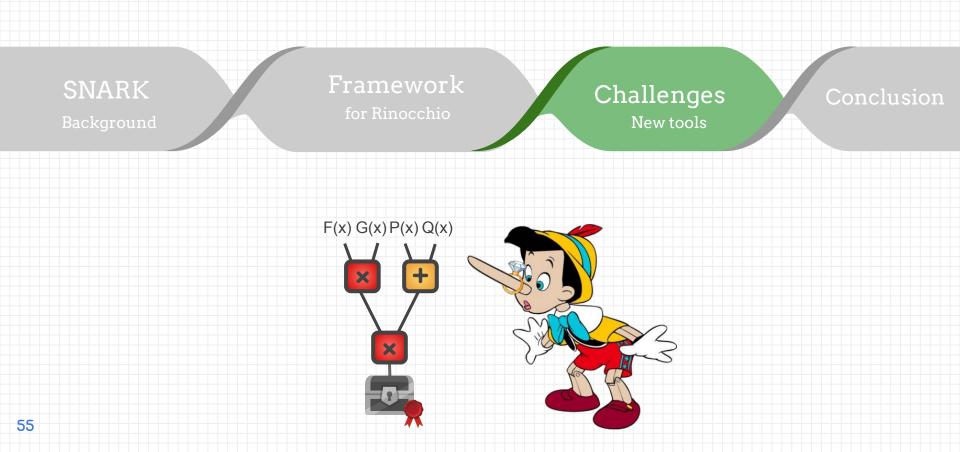


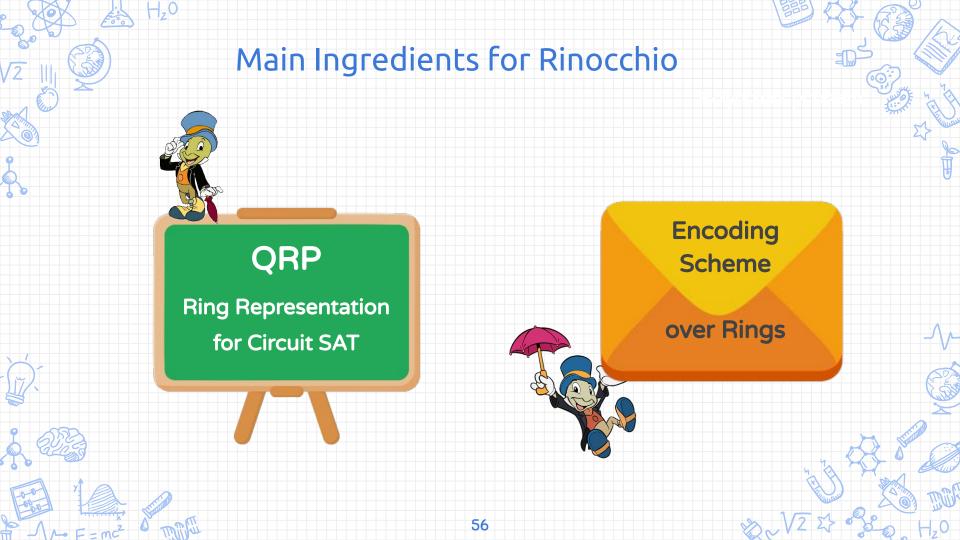
Fairness in Machine Learning

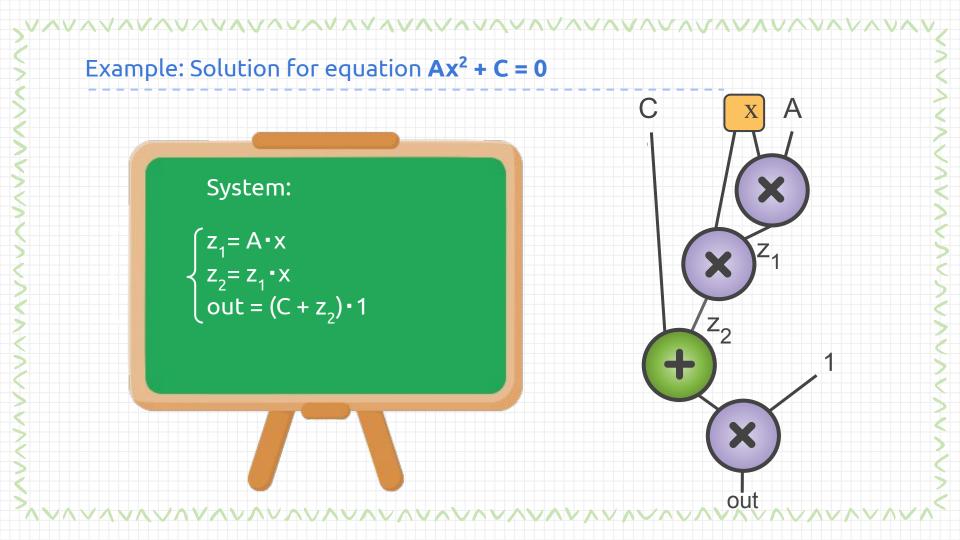
More SNARKs applications

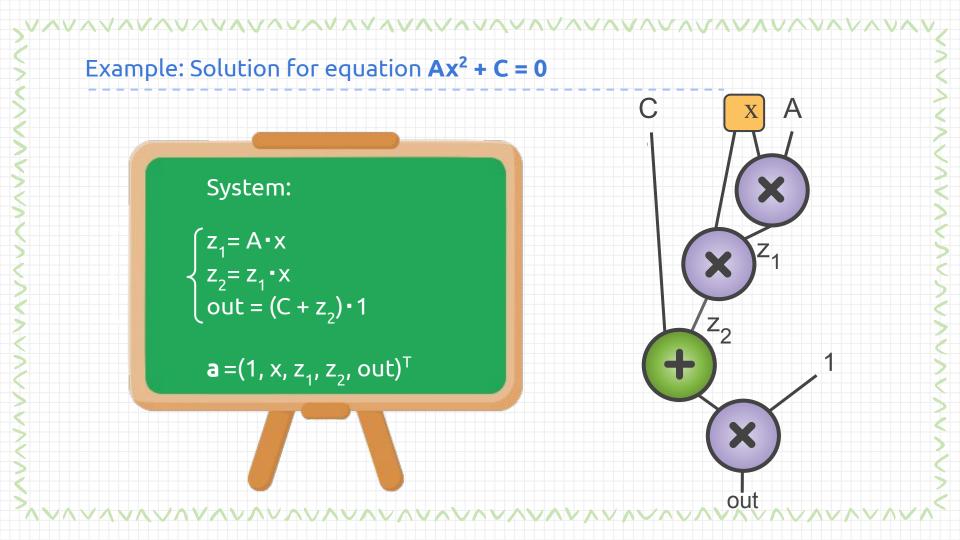


Technical Details









R1CS for vector $\mathbf{a} = (1, A, C, x, z_1, z_2, out)$

$$a = (1, x, z_1, z_2, out)^T$$

NV V V V V

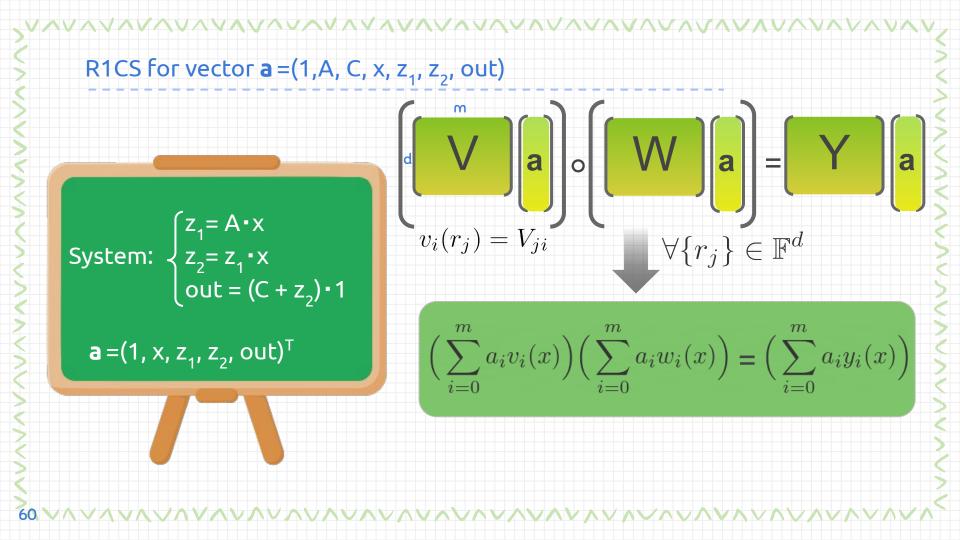
System: $\begin{cases} z_1 = A \cdot x \\ z_2 = z_1 \cdot x \\ out = (C + z_2) \cdot 1 \end{cases}$

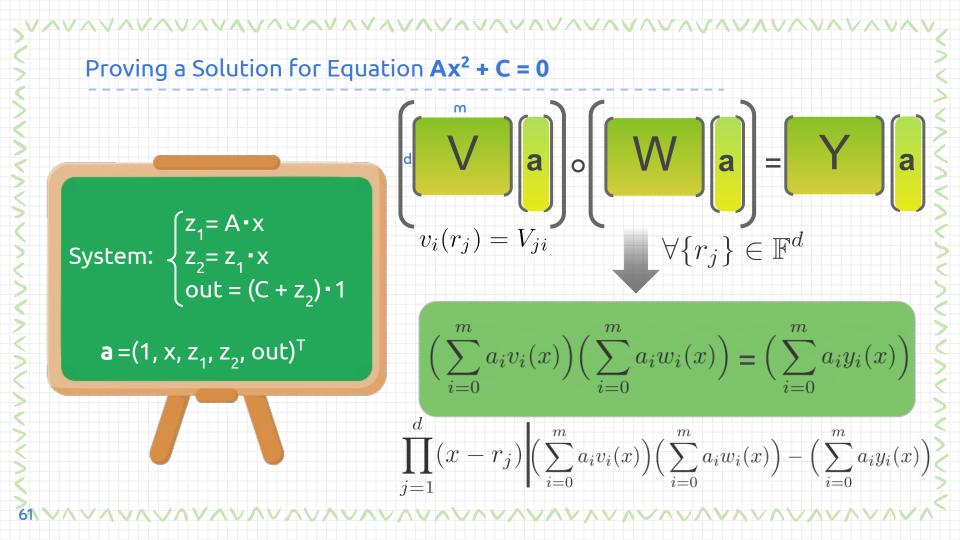
a =(1, x, z₁, z₂, out)^T

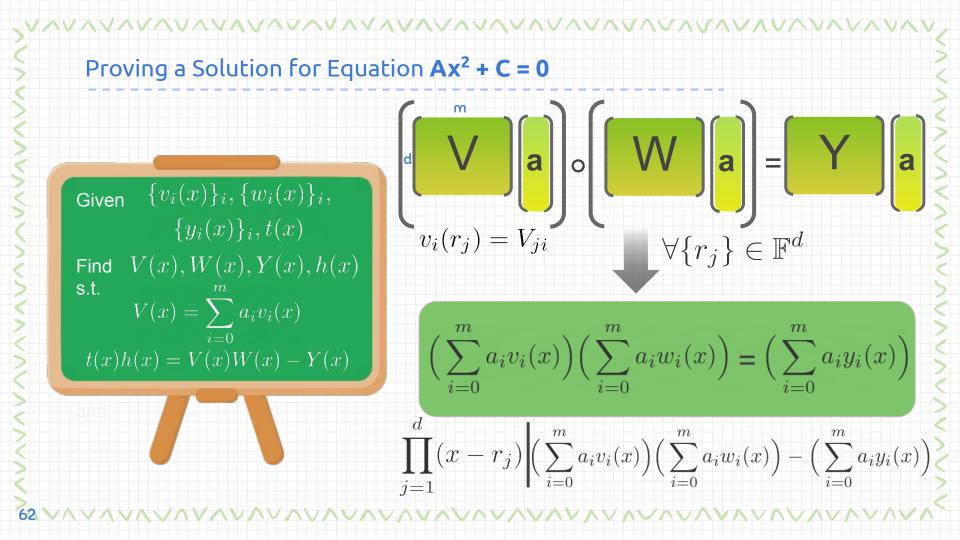
 $(A, 0, 0, 0, 0) \cdot \mathbf{a} \circ (0, 1, 0, 0, 0) \cdot \mathbf{a} = (0, 0, 1, 0, 0) \cdot \mathbf{a}$

 $(0, 0, 1, 0, 0) \cdot \mathbf{a} \circ (0, 1, 0, 0, 0) \cdot \mathbf{a} = (0, 0, 0, 1, 0) \cdot \mathbf{a}$

 $(C, 0, 0, 1, 0) \cdot \mathbf{a} \circ (1, 0, 0, 0, 0) \cdot \mathbf{a} = (0, 0, 0, 0, 1) \cdot \mathbf{a}$







Polynomial Equation with Coefficients in a Ring

63 V

$$t(x) = \prod_{j=1}^{d} (x - r_j) \left[\left(\sum_{i=0}^{m} a_i v_i(x) \right) \left(\sum_{i=0}^{m} a_i w_i(x) \right) - \left(\sum_{i=0}^{m} a_i y_i(x) \right) = p(x) \right]$$

Necessary property over Rings for Ideals $I_j = (x - r_j)$

Isomorphism for **QRP** soundness \Leftrightarrow **Ideals** I_j are co-prime:

$$\frac{R[x]}{(t(x))} \simeq \frac{R[x]}{I_1} \times \ldots \times \frac{R[x]}{I_d} \simeq R \times \ldots \times R$$
$$p(x) \quad \longmapsto \quad \left(p_1(x), \ \dots, p_d(x)\right) \quad \longmapsto \left(p(r_1), \ \dots, \ p(r_d)\right)$$

Polynomial Equation with Coefficients in a Ring Works for $R = \mathbb{F}$, as then $-r_j\Big) \left(\sum_{i=0}^m a_i v_i(x)\right) \left(\sum_{i=0}^m a_i w_i(x)\right) - \left(\sum_{i=0}^m a_i y_i(x)\right)\right)$ the ideals I_i are co-prime. Necessary perty over Rings for Ideals $I_i = (x - r_i)$ Isomorphism for **RP** soundness \Leftrightarrow **Ideals** I_i are co-prime: $\begin{aligned} \frac{R[x]}{(t(x))} &\simeq \frac{R[x]}{I_1} \times \ldots \times \frac{R[x]}{I_d} \simeq R \times \ldots \times R \\ p(x) &\longmapsto (p_1(x), \ \ldots, p_d(x)) \longmapsto (p(r_1), \ \ldots, \ p(r_d)) \end{aligned}$

Exceptional Sets: to the rescue!

Def: Let R be a commutative ring. A set $\mathbf{A} = \{g_1, ..., g_n\} \subset R$ is **exceptional** iff: $\forall i \neq j, (g_i - g_j) \in R^*$

65

Exceptional sets have **no further** algebraic **structure**. Not even <u>closure</u>!



Exceptional Sets

66

Def: Let R be a commutative ring. A set $\mathbf{A} = \{g_1, ..., g_n\} \subset R$ is **exceptional** iff: $\forall i \neq j, (g_i - g_j) \in R^*$

Exceptional sets have **no further** algebraic **structure**. Not even <u>closure</u>!



Given exceptional set **A**, the **ideals** $I_j = (x - g_j)$ are **pairwise co-prime** (i.e. $\forall i \neq j, I_i + I_j = R[X]$).

- Proof: $-(x g_i) + (x g_j) = (g_i g_j) \in \mathbb{R}^*$
- Meaning: We can apply CRT in R[X], for big enough $A \subset R$.

Exceptional Sets

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Def: Let R be a commutative ring. A set $\mathbf{A} = \{g_1, ..., g_n\} \subset R$ is **exceptional** iff: $\forall i \neq j, (g_i - g_j) \in R^*$

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Given exceptional set **A**, the **ideals** $I_j = (x - g_j)$ are pairwise co-prime (i.e. $\forall i \neq j, I_i + I_j = R[X]$).

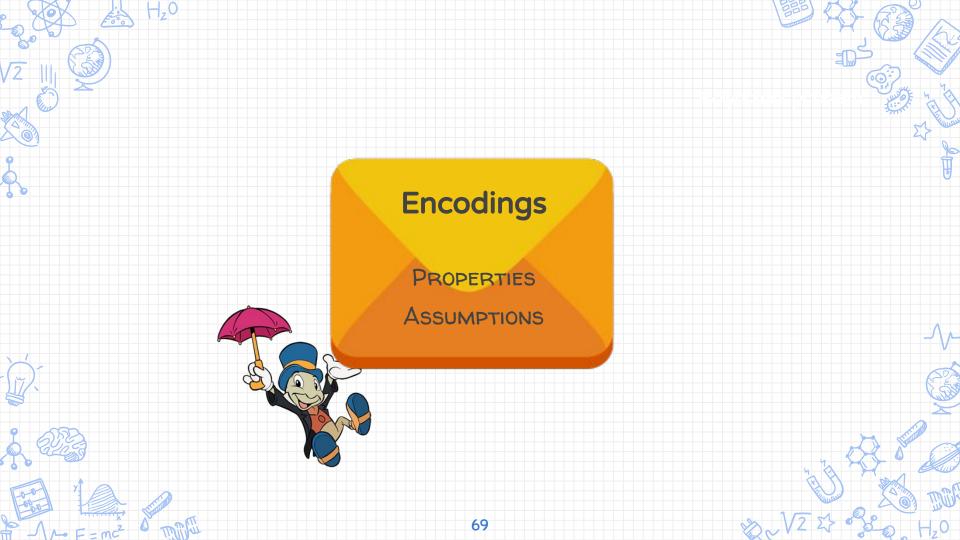
$$\frac{R[x]}{(t(x))} \simeq \frac{R[x]}{I_1} \times \ldots \times \frac{R[x]}{I_d} \simeq R \times \ldots \times R$$
$$p(x) \longmapsto (p_1(x), \dots, p_d(x)) \longmapsto (p(g_1), \dots, p(g_d))$$

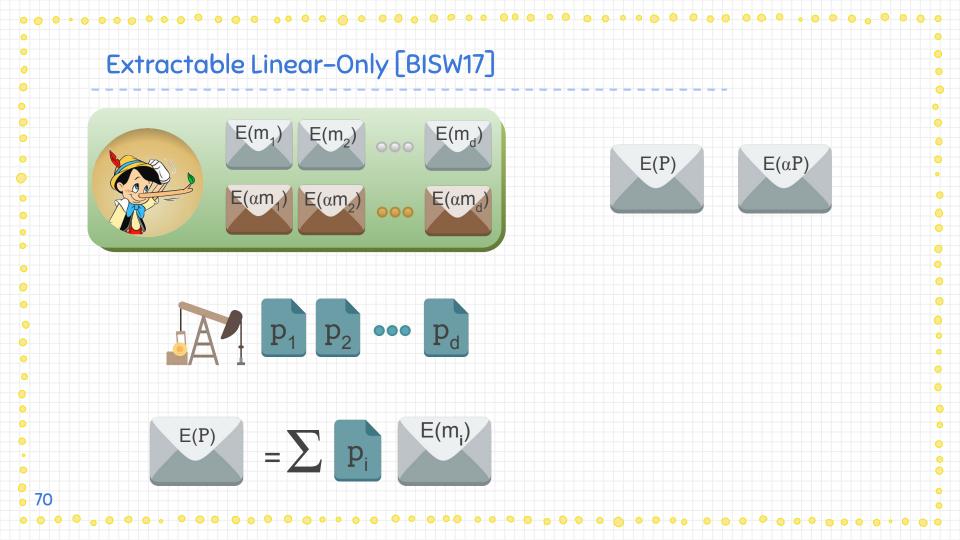
Schwartz-Zippel Lemma over Rings

$$t(x) = \prod_{j=1}^{d} (x - r_j) \left| \left(\sum_{i=0}^{m} a_i v_i(x) \right) \left(\sum_{i=0}^{m} a_i w_i(x) \right) - \left(\sum_{i=0}^{m} a_i y_i(x) \right) = p(x)$$

Lemma: Let
$$f \in R[X]$$
 be a non-zero poly.

$$\Pr[f(s) = 0] \le \frac{\deg(f)}{|A|}$$



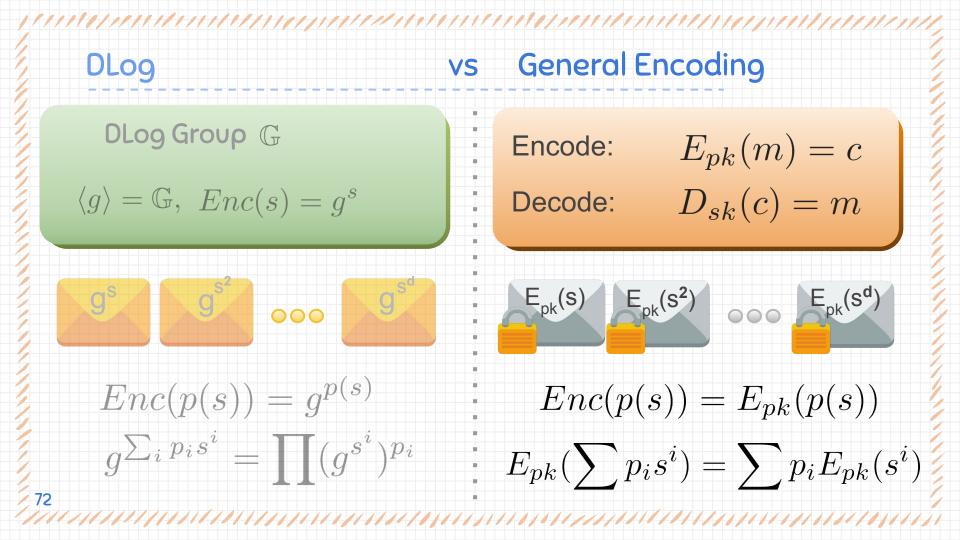


Encodings over Fields

DLog Group G

$$\langle g \rangle = \mathbb{G}, \ Enc(s) = g^s$$

$$Enc(p(s)) = g^{p(s)}$$
$$g^{\sum_{i} p_{i} s^{i}} = \prod (g^{s^{i}})^{p_{i}}$$



Ovadratic Root Detection – Pairings

$$\begin{aligned}
\langle g \rangle &= \mathbb{G}, \langle \tilde{g} \rangle = \tilde{\mathbb{G}} \\
Enc(s) &= g^s \quad e : \mathbb{G} \times \mathbb{G} \to \tilde{\mathbb{G}} \\
e(g^a, g^b) &= \tilde{g}^{ab}
\end{aligned}$$
Quadratic root detection **public**

$$t(s)h(s) \stackrel{?}{=} p(s) \\
e(g^{t(s)}, g^{h(s)}) \stackrel{?}{=} e(g^{p(s)}, g)
\end{aligned}$$

Publicly VerifiablevsDesignated Verifiable
$$\langle g \rangle = \mathbb{G}, \langle \tilde{g} \rangle = \tilde{\mathbb{G}}$$
 $Enc(s) = g^s$ $e: \mathbb{G} \times \mathbb{G} \to \tilde{\mathbb{G}}$ $Enc(s) = g^s$ $e: \mathbb{G} \times \mathbb{G} \to \tilde{\mathbb{G}}$ $Encode:$ $E_{pk}(m) = c$ $e(g^a, g^b) = \tilde{g}^{ab}$ $Encode:$ $D_{sk}(c) = m$ Quadratic root detection public $Uudratic root detection needs$ $Uudratic root detection needs$ $t(s)h(s) \stackrel{?}{=} p(s)$ $u(s)h(s) \stackrel{?}{=} p(s)$ $h(s)$ $e(g^{t(s)}, g^{h(s)}) \stackrel{?}{=} e(g^{p(s)}, g)$ $p(s)$ $h(s)$

Encoding Instantiation for LWE Rings
Rings of the form
$$\mathscr{R}_q = \mathbb{Z}_q[X]/(h(X))$$
. TFHE $\mathbb{R}_q \approx \mathbb{Z}_q^n \quad \mathbb{Z}_q \approx q^{-1}\mathbb{Z}/\mathbb{Z}$
 $\widetilde{vov} = \{0, ..., p_1 - 1\} \subset \mathscr{R}_q; \quad q = \prod p_i \text{ s.t. } p_1 < p_2 < ...$
Advantages & Future directions:
 \mathscr{L} Supports "somewhat homomorphic" variants of **BGV** [BGV12] and **FV** [FV12]
 \mathscr{L} Allows for significantly better choices for RLWE parameters

- **X** First SNARK to support rings with $q \neq$ prime \rightarrow more expressive FHE
- ★ We enable new FHE operations → new circuits for plaintext packing, modulo switching

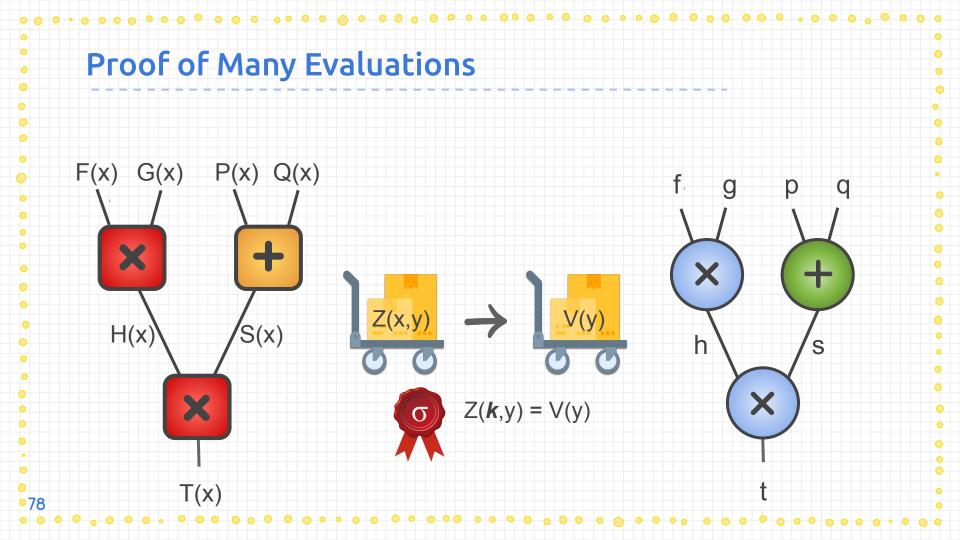
× : (We are only designated-verifier, we don't support Bootstrapping operations

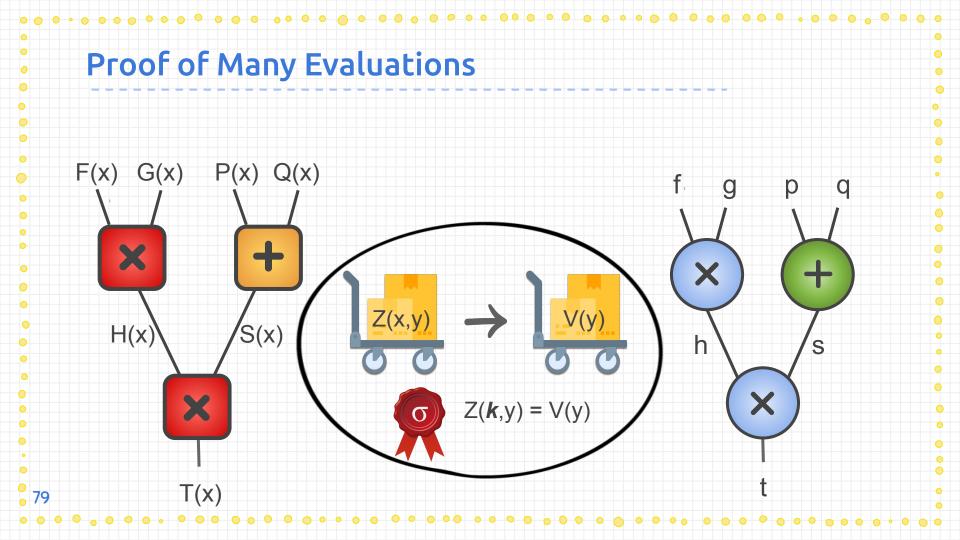
Rings of the form $\Re_q = \mathbb{Z}_q[X]/(h(X))$. $q = \prod p_i \text{ s.t. } p_1 < p_2 < \dots$ TFHE $\mathbb{R}_q \approx \mathbb{Z}_q^n$ $\mathbb{Z}_q \approx q^{-1}\mathbb{Z}/\mathbb{Z}$ Performance Evaluation: \star # levels L for BGV [BGV12] and FV [FV12]	Encoding Instantiation for LWE Rin	
$q = \prod p_i \text{ s.t. } p_1 < p_2 < \dots$ $FHE \mathbb{R}_q \approx \mathbb{Z}_q^n \mathbb{Z}_q \approx q^{-1}\mathbb{Z}/\mathbb{Z}$ $BGV 2 2^{12} 47 109 \\ FV 2 2^{13} 48 218 \\ BGV 4 2^{14} 51 438 \\ FV 4 2^{14} 51 438 \\ FV 6 2^{14} 51 438 \\ FV 6 2^{14} 51 438 \\ FV 6 2^{14} 51 438 \\ BGV 8 2^{15} 51 881 \\ FV 8 2^{14} 50 438 \\ BGV 8 2^{15} 51 881 \\ FV 8 2^{14} 50 438 \\ BGV 10 2^{15} 56 881 \\ FV 10 2^{15} 56 81 \\ FV 10 2^{15} 56 81 \\ FV 10 2^{15} 56 81 \\ FV 10 8^{16} 10 8^{16} 10 8^{16} 10 10 10 10 10 10 10 1$	Rings of the form $\mathscr{R}_q = \mathbb{Z}_q[X]/(h(X)).$	
FV 4 2^{14} 51 438 BGV 6 2^{14} 51 438 BGV 6 2^{14} 51 438 BGV 6 2^{14} 51 438 BGV 8 2^{15} 51 881 FV 8 2^{14} 50 438 BGV 8 2^{15} 51 881 FV 8 2^{14} 50 438 BGV 10 2^{15} 56 881 FV 10 2^{15} 56 881		$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
FV 8 2^{14} 50 438 Performance Evaluation: BGV 10 2^{15} 56 881 BGV 10 2^{15} 56 881 FV 10 2^{15} 56 881		$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
→ × TFHE performance for such plaintexts? FV 12 2 ¹⁵ 57 881	 Performance Evaluation: # levels L for BGV [BGV12] and FV [FV12] 	$\frac{\text{FV}}{\text{BGV}} = 8 2^{14} 50 438$

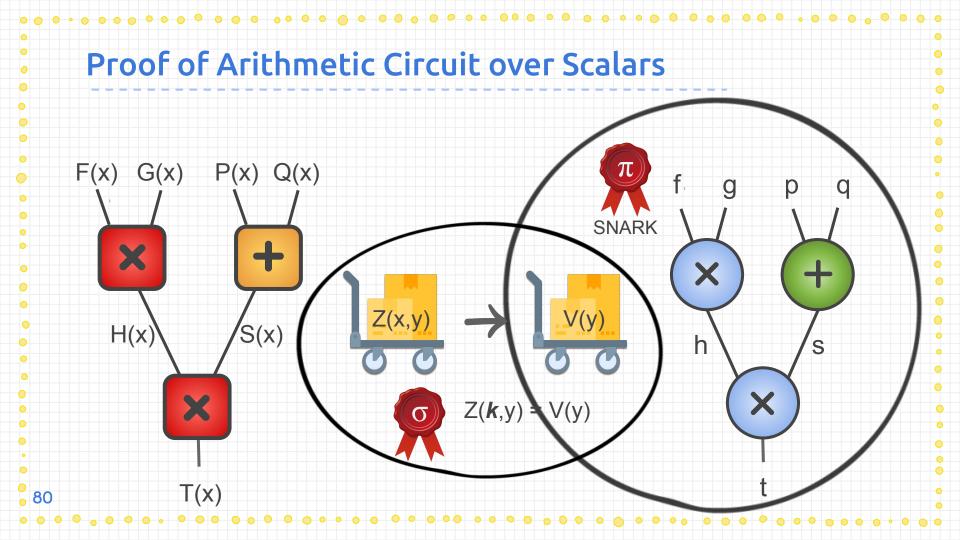
[PKC:FNP20] SNARK approach



Verifiable CaP zk-SNARK **ZK Proof** for evaluation **Compactly Commit** Computation for arithmetic circuit in random point **k** to Polynomials with over scalars **Privacy** + X + VC $C_{\mathbb{R}_q}$ $C_{\mathbb{Z}_q}$ X







FHE Arithmetics: tailored SNARKs

[FVP20] Boosting Verifiable Computation on Encrypted Data

Dario Fiore, Anca Nitulescu, David Pointcheval

- ★ Only supports rings of polynomials $\mathbb{R}_q = \mathbb{Z}_q[x]/R(x)$ for q prime \rightarrow inefficient FHE
- X Does not support operations for bootstrapping, rescaling etc. in FHE
- Modular Commit&Proof Composition
- X Publicly Verifiable, anyone can verify without key
- X Zero-Knowledge for inputs and computation

More specific FHE computations: MyOPE

[INPP21] Malicious securitY for Oblivious Polynomial Evaluation

Malika Izabachène, Anca Nitulescu, Paola de Perthuis, David Pointcheval

- SNARK for Inner-Product over ciphertexts: adds security against malicious parties X
- Reduce communication in 2PC with FHE X
- Applications to PSI X

Receiver: point a

Sends C(aⁱ) for some i

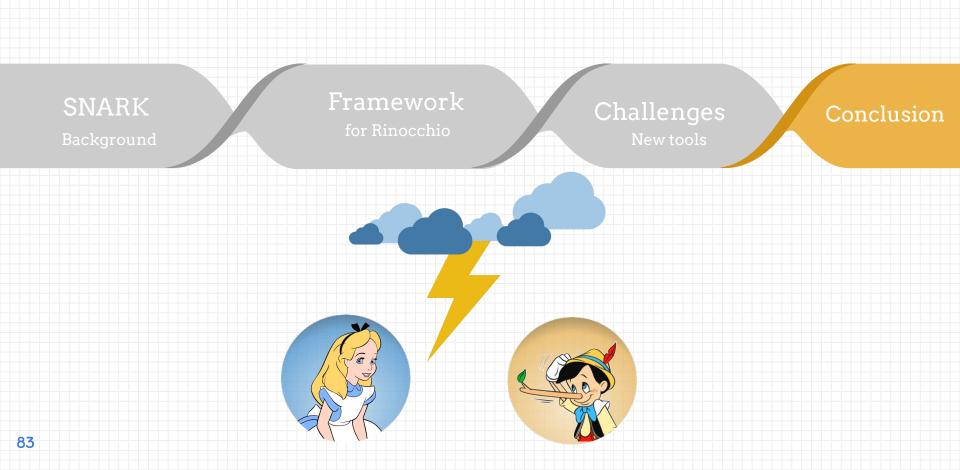
Receives C(p) and π

Sender: $P(X) = p_i x^i$

Computes Eval p=P(a): $C(p) = \langle C(a^{i}), p_{i} \rangle$

Proves eval π

Conclusions



Conclusions

Quadratic Programs and SNARKs over fields

- X Lots of implementations, but they fall short in one aspect
- **×** Emulating ring arithmetic on SNARKs is expensive and unfriendly to applications
- X Today's cost: Compilation to circuits over fields, costly preprocessing

Rinocchio: SNARKs for Ring Arithmetics

- X Circuit-SAT for arithmetic circuits over commutative rings: Quadratic Ring Programs (QRP)
- **×** Better fits FHE schemes arithmetics $\mathbb{R}_q = \mathbb{Z}_q[x]/R(x)$ even for q not prime
- X Supports sub-circuits for special operations in FHE: modulo switching
- ✗ Designated Verifier only
- X Can be turned Zero-Knowledge using Context Hiding techniques

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Open Questions

- X Other Encodings over rings \rightarrow publicly verifiable
- X More efficient instantiations: Security assumptions over rings: L-O extractable vs PKE



Credits

Special thanks to all those who made and released these resources for free:

- **X** Presentation template by <u>SlidesCarnival</u>
- **X** Illustrations by <u>Disneyclips</u>, <u>Iconfinder</u> and <u>Flaticon</u>